

The Use of Agent-Based Modeling and Data Farming for Planning System of Systems Tests in Joint Environments

Mary McDonald

Stephen Upton

Gary Horne

Operations Research Department

Naval Postgraduate School

Monterey, CA



76th MORSS
June 2008

SEED Center Mission: Advance the collaborative development and use of simulation experiments and efficient designs to provide decision makers with timely insights on complex systems and operations

Report Documentation Page			Form Approved OMB No. 0704-0188					
<p>Public reporting burden for the collection of information is estimated to average 1 hour per response, including the time for reviewing instructions, searching existing data sources, gathering and maintaining the data needed, and completing and reviewing the collection of information. Send comments regarding this burden estimate or any other aspect of this collection of information, including suggestions for reducing this burden, to Washington Headquarters Services, Directorate for Information Operations and Reports, 1215 Jefferson Davis Highway, Suite 1204, Arlington VA 22202-4302. Respondents should be aware that notwithstanding any other provision of law, no person shall be subject to a penalty for failing to comply with a collection of information if it does not display a currently valid OMB control number.</p>								
1. REPORT DATE 01 JUN 2008	2. REPORT TYPE N/A	3. DATES COVERED -						
4. TITLE AND SUBTITLE The Use of Agent-Based Modeling and Data Farming for Planning System of Systems Tests in Joint Environments			5a. CONTRACT NUMBER					
			5b. GRANT NUMBER					
			5c. PROGRAM ELEMENT NUMBER					
6. AUTHOR(S)			5d. PROJECT NUMBER					
			5e. TASK NUMBER					
			5f. WORK UNIT NUMBER					
7. PERFORMING ORGANIZATION NAME(S) AND ADDRESS(ES) Operations Research Department Naval Postgraduate School Monterey, CA			8. PERFORMING ORGANIZATION REPORT NUMBER					
9. SPONSORING/MONITORING AGENCY NAME(S) AND ADDRESS(ES)			10. SPONSOR/MONITOR'S ACRONYM(S)					
			11. SPONSOR/MONITOR'S REPORT NUMBER(S)					
12. DISTRIBUTION/AVAILABILITY STATEMENT Approved for public release, distribution unlimited								
13. SUPPLEMENTARY NOTES See also ADM202527. Military Operations Research Society Symposium (76th) Held in New London, Connecticut on June 10-12, 2008, The original document contains color images.								
14. ABSTRACT								
15. SUBJECT TERMS								
16. SECURITY CLASSIFICATION OF: <table border="1" style="display: inline-table; vertical-align: middle;"> <tr> <td style="padding: 2px;">a. REPORT unclassified</td> <td style="padding: 2px;">b. ABSTRACT unclassified</td> <td style="padding: 2px;">c. THIS PAGE unclassified</td> </tr> </table>			a. REPORT unclassified	b. ABSTRACT unclassified	c. THIS PAGE unclassified	17. LIMITATION OF ABSTRACT UU	18. NUMBER OF PAGES 19	19a. NAME OF RESPONSIBLE PERSON
a. REPORT unclassified	b. ABSTRACT unclassified	c. THIS PAGE unclassified						

**MORS****GOVERNMENT
DISCLOSURE FORM****712B****MORS P#:** (if known)**DEADLINE: 2 MAY 08**
Fax to: 703-933-9068**PART 1****Author Response:** The presentation is believed to be unclassified. Distribution is limited to the attendees of the MORS Symposium. The presentation will be included in the MORS Final Report for information on the MORS 2008 Conference.

Principal Author:

Mary McDonald

Other Author(s):

Gary Horne, Stephen Upton

Principal Author's Organization:

Naval Postgraduate School*Mary McDonald*

Complete mailing address:

**1411 Cunningham Rd
Monterey, CA 93943**Principal Author's Signature: Date: **3/25/2008**Phone: **(703) 655-8234**FAX: **(703) 590-8802**Email: **mlmcdona@nps.edu**

Title of Presentation:

The Use of Agent-Based Modeling and Data Farming for Planning System of Systems TestsThis presentation is believed to be: **SECRET** **CONFIDENTIAL** **UNCLASSIFIED** and will be presented in: Special Session Tutorial Demo CG: A-B-C-D-E-F (Circle one) List all WG(s) #: **31****PART 2****Government Release of Oral Endorsement and Distribution** (5730-24, 5730-25, 5730-26)

The Releasing Official, with the understanding that MORS Symposia are supervised by the OCNO N81, that all attendees have current security clearances of at least SECRET and that no foreign nationals will be present confirms that the overall classification of the presentation is:

 SECRET **CONFIDENTIAL** **UNCLASSIFIED** **OTHER:** _____ and authorizes disclosure at the meeting.

Classified by:

N/A

Declassified by:

N/A

Downgrade to:

N/A

On:

The applicable distribution statement below must be checked and stated to complete this form.**Distribution statement A:**

This presentation/paper is unclassified, approved for public release, distribution unlimited, and is exempt from U.S. export licensing and other export approvals under the International Traffic in Arms Regulations (22 CFR 120 et seq.).

**Other distribution statement:** (List here or attach separate sheet)*N/A*Releasing Official's title: **ASSISTANT SECURITY MANAGER** *Guillermo Costello*Printed name: **GUILLERMO COSTELLO**Releasing Official's Signature: Organization: **NAVAL POSTGRADUATE SCHOOL**Date: **05 MAY 2008**Complete mailing address: **Security Manager Code 261
Naval Postgraduate School
1411 Cunningham Rd, Rm B-13
Monterey, CA 93943-5015**Phone: **831-656-2450**FAX: **831-656-2350**

Agenda

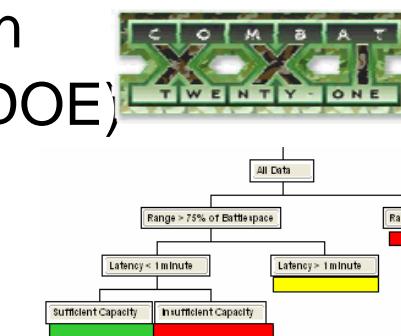
- SEED Center and Philosophy
- Data Farming
- Support to Joint Test and Evaluation Methodology (JTEM)
- Agent Based Modeling
- “TheTester” ABM

SEED Center in a nutshell...

Enable rapid and efficient computational experimentation and analysis to be readily available to those informing decision makers

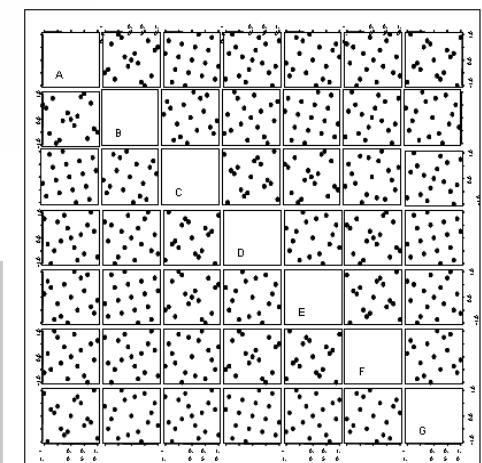
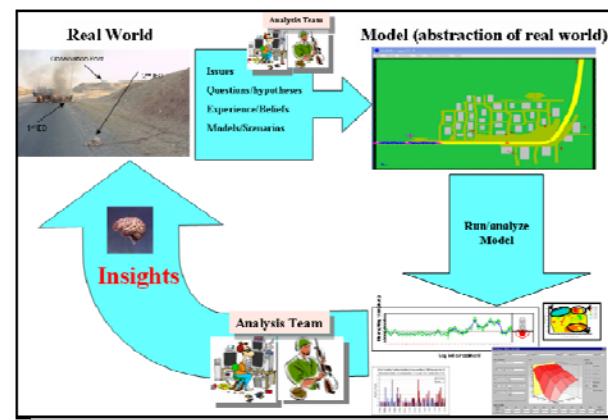
- **Harnessing Enabling Technologies**

- High-performance computation
- New Design of Experiments (DOE)
- (Emerging) models
- Data mining and visualization



- **Revolution in analysis capabilities**

- Quick turnaround...
- Address uncertainties
- Robust solutions



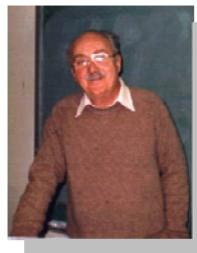
Resources: SEED Center for Data Farming

<http://harvest.nps.edu>

Check here for:

- lists of student theses (available online)
- spreadsheets & software
- pdf files for several of our publications, publication info for the rest
- links to other resources
- updates

All models are wrong, but some are useful—George Box



I DON'T KNOW HOW
TO DO STATISTICS BUT
IT DOESN'T MATTER
BECAUSE I DIDN'T
HAVE DATA.

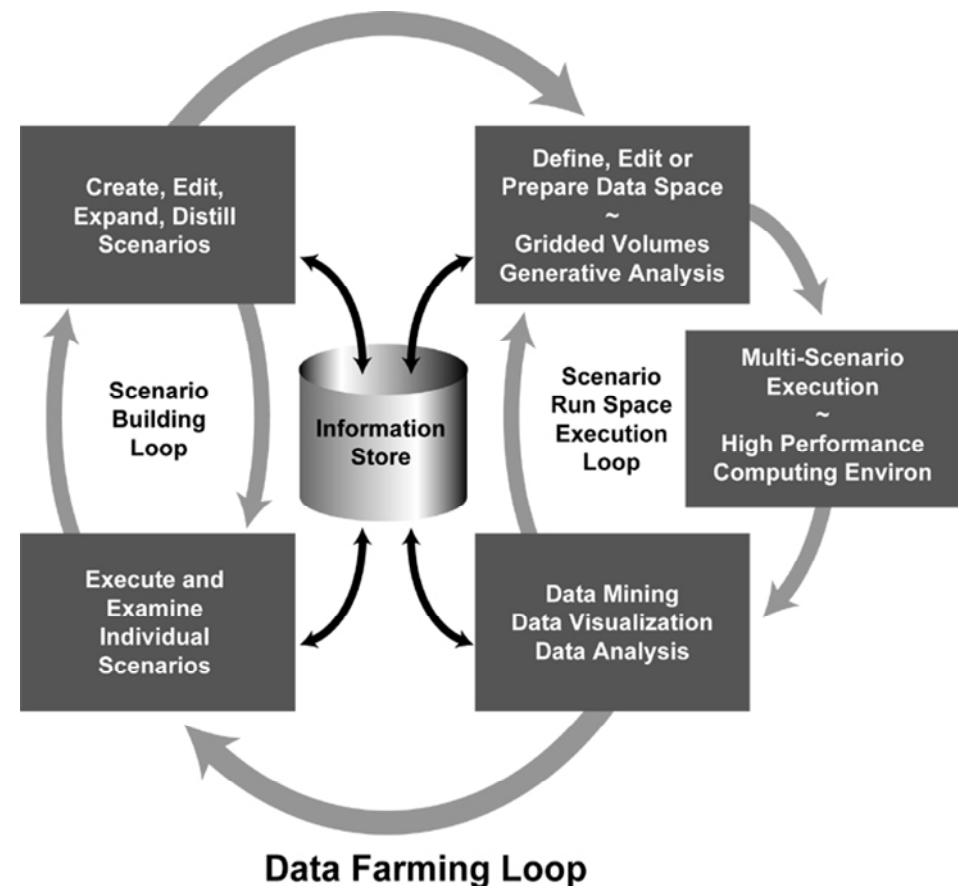


Data Farming: Iterative Loop of Loops

- **Data Farming Loop**
 - **Scenario/Model Building Loop**
 - Iterate model/simulation for experiment definition and analysis to support definition of hypothesis, and areas of interest
 - **Possibility Space Development Loop**
 - Iterate model/simulation using high-performance computing to refine analysis, study parameter sensitivity, drill-down into areas of interest, and confirmation or refutation of hypothesis
 - Data exploration, mining

and then

- **Adjust-Synthesize (another loop)**
 - Adjust model/simulation with knowledge/concepts/intuition from data farming...
Repeat



Support to Joint Test & Evaluation Methodology

- **Overall Objective:** Determine if analytical techniques employing agent-based models and data farming can be applied to the following areas
 - Helping to select a limited number of test vignettes for accomplishment in an actual L/V/C joint mission environment
 - Determining overall joint mission effectiveness
 - Establishing the relationship between system or system-of-system performance and joint mission effectiveness
- **Previous Effort:**
 - Tested other agent-based models for applicability
 - Ran computational experiments within the SEED Center's Data Farming environment
 - Developed custom-made agent-based modeling environment ("TheTester")

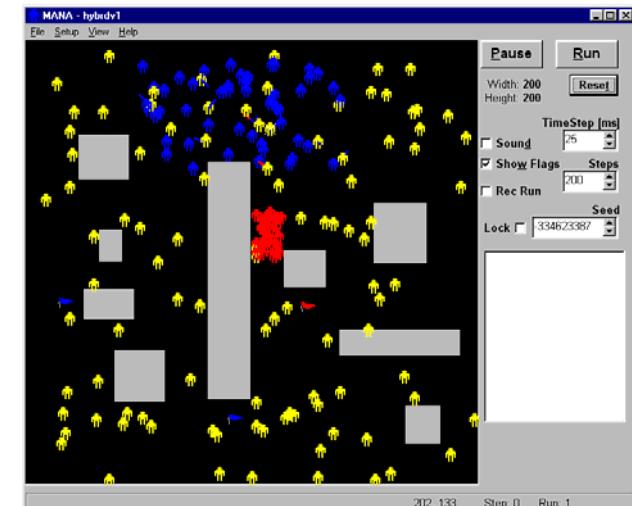
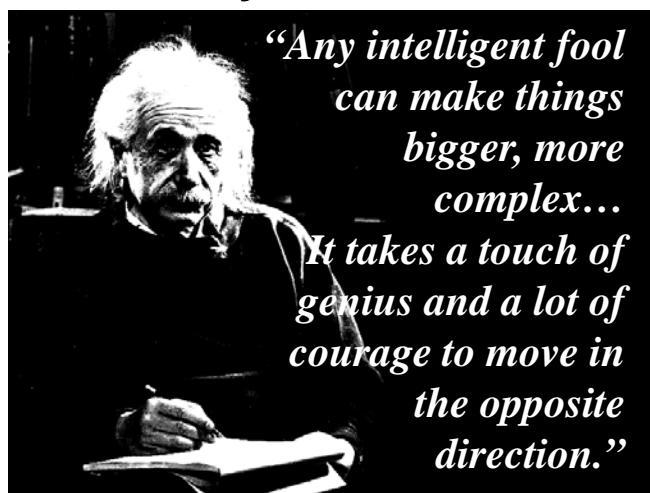
Agent Based Modeling (ABM)

- **What is an ABM?**

- Composed of (usually) relatively simple discrete autonomous entities making decisions based on interactions with other agents and their local environment
- Are characteristically intuitive, transparent, transportable, repeatable, and farmable
- Have been useful in studying complex adaptive systems in a number of domains

- Several have been developed specifically for military domain (ISAAC, MANA, Pythagoras, SEAS)

- **Scenarios (usually) can be produced in a matter of hours/days vs weeks/months**



“TheTester” ABM

- **Motivation:** To address some of the limitations encountered using more traditional agent-based models based on reactive agents, while retaining their strengths in farmability, ease of use, and fast run times
- **Primary Design Goal:** Focus on Systems of Systems testing, initially modeling one aspect (Joint Fires) of the C2 Joint Capability Area (JCA)

“TheTester”: Model structure

- Is written in JAVA, and uses the MASON multi-agent simulation toolkit for its underlying simulation infrastructure
www.cs.gmu.edu/~eclab/projects/mason/
- Time-stepped
- Continuous 3D space, flat terrain
- Uses XML for input - working on an Automated Scenario Generator
- Selectable MOEs (CSV output)
- 3D visualization with probes

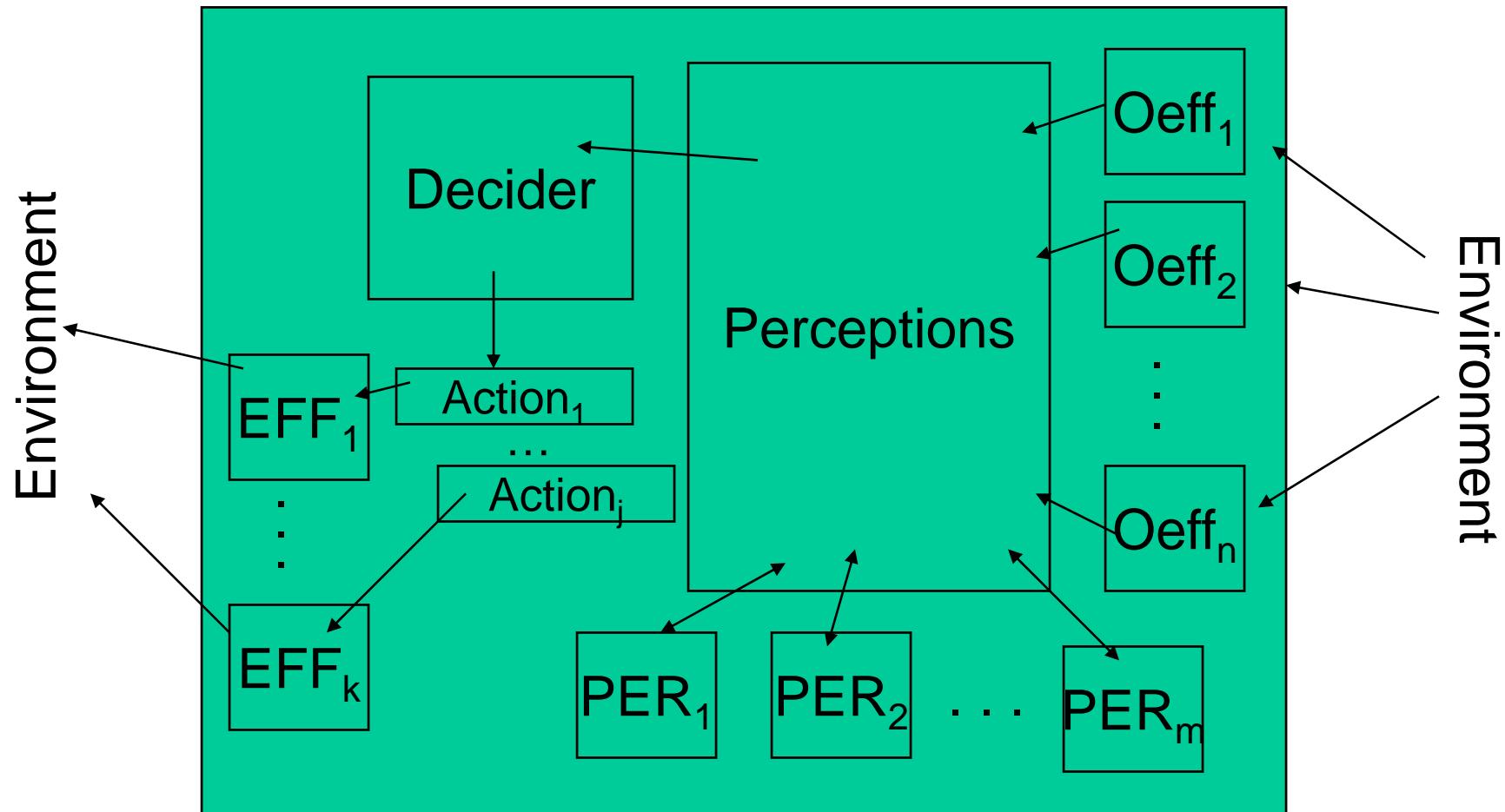
“TheTester”: Other Design Goals

- Composable
 - allows users to build up or construct agents using software components specific to the domain
- Extensible
 - allows users to develop their own software components to extend functionality provided by the basic framework
- Farmable
 - enhances computational experiments with the model by allowing users to easily vary input parameters associated with the agents
- Fast-running
 - analyses could be completed within a reasonably short period of time, commensurate with our experience with other agent-based models used for similar purposes

Agent Decision Making

- Each Agent has OODA loop
- “Observe” - depends on whether Agent has Effector for sensing
- Orient
 - Process Comm messages
 - Update Perceptions from other Perceivers
- Decide
 - Agent Decision Making is based on Deciders: these are composable object structures that base decisions on Perceptions - SimpleRuleBaseDecider currently implemented. Different agents can have different Deciders. SimpleRuleBaseDecider has a set of Rules that are a conjunction of Clauses (Perception Condition Value), with Actions as consequents
 - E.g., If NewEnemyDetected then SendMessageASR
- Act
 - Each Agent has a set of Actions that it can accomplish (based on what Effectors can do)

“TheTester”: Agent structure



Examples (Implemented So Far)

- Observe-type Effectors
 - CookieCutterSensor
- Perceivers
 - SimpleThreatPerceiver
 - BasicMessageProcessor
 - MessageSentTracker
 - MemoryContactFilter
- Other Effector types
 - MoveAlongWaypoints
 - AgentCarrier / AgentCarried
 - BasicMessageSender
 - SingleMissionEffect
 - MultipleMissionEffect
 - FiresMissionTasker
 - BasicIndirectWeapon

Examples (cont.)

- Perceptions (concepts an agent “knows about”)
 - AgentPercept
 - LocationPercept
 - MessagePercept
 - Observation
 - RestrictedOperatingZone
 - SimplePercept
 - TargetPercept
- Deciders (used to choose an action, based on the current state of perceptions)
 - SimpleMoveDecider
 - RuleBaseDecider

Comm modeling

- CommLinks
 - Explicit communication links specified in input file
 - Reliability for the link
 - Range for the link
- MessageData – for each message class
 - messageClass for each message
 - probUnderstood
 - inProcessTime, inProcessTimeOffset
 - outProcessTime, outProcessTimeOffset
 - probability distribution used for times
- MessageHandlers - for inserting and extracting content
- Implemented Message Handlers
 - CallForFireMessageHandler
 - FiresMissionMessageHandler
 - GoToRequestMessageHandler
 - ThreatLocationMessageHandler

FY07 Scenario Comm Matrix

	RSTA	BNFSE	BDEFSE	CAOC/JAOC	ASOC	AWACS	FIRE BN	NLOS/FSPM	JSTARS	JTAC	CAS_AIRCRAFT	NETW
RSTA		CFF										
BNFSE			RELAY-CFF									
BDEFSE				ACMREQ1; ACMREQ1-COP RFZ	ACMREQ1-COP ACMREQ2; RFZ							
CAOC/JAOC			RELAY-ACMR APPROVAL		ACMREQ1-APPF COPY; ACMREQ1- APPROVAL	ACMREQ1- COORD			ACMREQ2 APPROVA			
ASOC			ACMREQ2- COORD			ASR- APPROVAL TASKING				ASR-APPRO TASKING		
AWACS				ACMREQ1- APPROVAL							CASMISSION	
FIRE BN FSE								RELAY- FIREMISS				
NLOS/FSPM	SHOT-CONF	SHOT-CONF	SHOT-CONF	SHOT-CONF	RM		SHOT- CONFIRM					
JSTARS										THREATLOC		
JTAC			ASR								9LINE-ORDE	RETARGET- ORDER
CAS_AIRCRAFT									ONSTATION		THREATLOC LAUNCHORD HANDOFF ORDER	
									WPN-COOR TRANSFER			

Short Term Future Work on “TheTester” Will Include ...

- Expert System / Fuzzy Logic Decider (JESS, Fuzzy JESS)
- Move to a Discrete Event Framework
- GUI / Automated Scenario Generator

QUESTIONS?